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# A proactive/reactive approach to deal with disturbances in Volunteer Computing Platforms

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Introduction

State of the art

Adaptation of HEFT to the availability constraint

Stable algorithm for disturbed environments

More reactive approach

Validation and Empirical study

Conclusion



## Introduction

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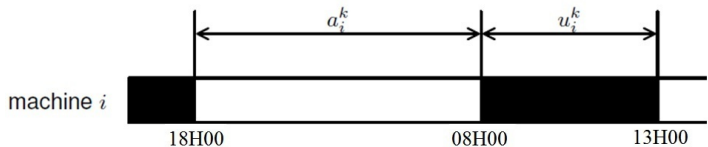
Internet : a reserve of underexploited resources

### Volunteering :

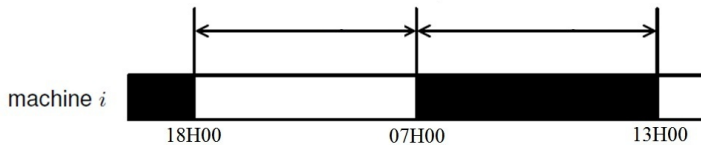
- ++ Many actors
- ++ Acceptable performance (technological evolution)
  - Latent instability
  - Short lived

### Collaboration :

- ++ Long-run (Institutional)
- ++ More or less – stable performance
  - Not always evident to place
  - Conflict of interest



Provided Instance



Real Instance



Tasks, machines and objective :

- ▶ Tasks :  $n$  non preemptive independent tasks of cost  $p_j$
- ▶ Machines
  - ▶  $m$  machines having speed  $S_j$
  - ▶ Machine  $j$  is only available during giving intervals
- ▶ Objective
  - ▶ Makespan (Taken uncertainty into account)
  - ▶ **Stability : Not altered by disturbances**



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- ▶ Scheduling problem entries : Jobs (tasks), Processors (machines), structure (Communication, Arrival dates ....)
- ▶ Offline schedule : All the parameters are known in advance
- ▶ Online schedule: Not all parameters are known a priori
- ▶ Scheduling with uncertainties
  - ▶ We have prevision on data
  - ▶ No complete information





- ▶ Desktop grids : Uncertainty by nature (volunteer contribution, no control, ...)
- ▶ Uncertainty on dates, events,
- ▶ Cost (execution time) : depends to the real load
- ▶ Structure : Unpredicted tasks, task cancellation, task removal ....
- ▶ Communication structure
- ▶ Communication delay (correlated to network load)



- ▶ Robust schedule : Not (or not very much) altered with disturbances

## Resolution scheme

**STEP 0** : Modelisation

**STEP 1** : Static phase : Compute a set of feasible solution

**STEP 2** : Dynamic phase : Compute the final (executed) solution



## ► Proactive

- Focus on Step 1
- Design a reference or a set of reference schedules
- Some **simple** adjustment may be done to keep the schedule feasible

## ► Reactive

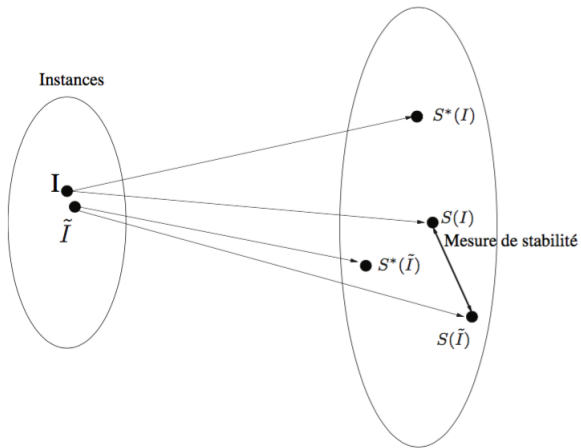
- Focus on Step 2
- Most decisions are taken at the execution phase
- Decisions may take long time to be taken

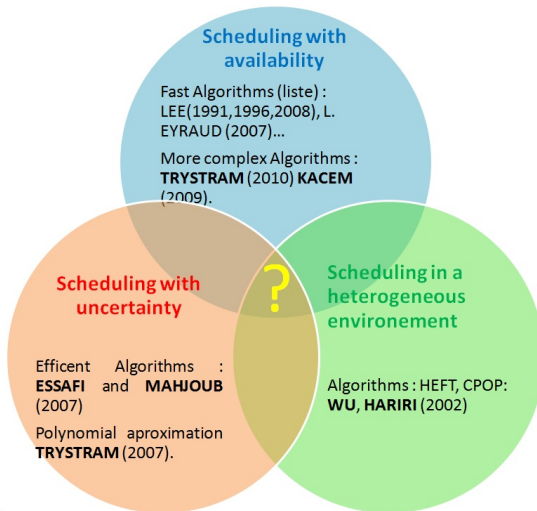
## ► Proactive/Reactive

- Proactive + Sophisticated reaction algorithm (phase 2)
- Rectification and/or repotimisation



- ▶ Let  $I$  be the predicted instance and  $\tilde{I}$  the disturbed one
- ▶ Let  $C_{max}^*$  and  $\tilde{C}_{max}^*$  be the optimal solutions for the predicted and disturbed instances
- ▶ Let  $C_{max}(A)$  and  $\tilde{C}_{max}(A)$  the makespan
- ▶ Stability :  $\rho = \max_I \frac{\tilde{C}_{max}(A)}{C_{max}(A)}$
- ▶ Optimal stability is achieved when  $\rho = 1$







HEFT principle for DAGs

## Phase 1

- ▶ Calculation of the priority of each task ( $rank_u$ ), which is based on the average calculation and communication costs.
- ▶ The task list is generated by sorting the tasks in decreasing order of  $rank_u$ .

## Phase 2



HEFT principle for DAGs

## Phase 1

- ▶ Calculation of the priority of each task ( $rank_u$ ), which is based on the average calculation and communication costs.
- ▶ The task list is generated by sorting the tasks in decreasing order of  $rank_u$ .

## Phase 2

- ▶ For most scheduling algorithms, the availability date for a processor  $p_j$  is the end of execution of its last task assigned.
- ▶ Insertion policy
- ▶ Possibility of insertion of a task in an interval of inactivity





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- ▶  $EST(i, j) = avail(j, i)$  : First date in which  $j$  can execute task  $i$
- ▶  $EFT(i, j) = EST(i, j) + \frac{P_i}{S_j}$  : End date of  $i$  task if executed on processor  $j$
- ▶  $rank_u(i)$  : Priority of the task  $i$



1. Compute the  $\text{Rank}_u$  and the average cost of processing for all tasks
2. Sort all tasks in order of decreasing values of  $\text{Rank}_u$ .
3. **While** there are unscheduling tasks in the list **do**
5.     Select the first task,  $n_i$ , from the list for scheduling
6.     **For** each processor  $p_k$  in the processor-set ( $p_k \in Q$ ) **do**
7.         Compute the availability date for  $n_i$  ( $\text{avail}[p_k, n_i]$ )
7.         Compute EFT ( $n_i, p_k$ ) value
8.         Assign task  $n_i$  to the processor  $p_k$  that minimize EFT of task  $n_i$ .
9.     **endwhile**

# What's wrong with HEFT-AC ?



## Risks

- ▶ Can fill an interval availability entirely
- ▶ Uncertainty unawareness ?

## Improvement

- ▶ We must improve the allocation of tasks to machines using the availability model.



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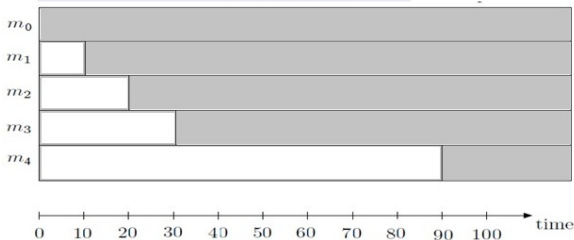
Performance modeling , Kondo et al.

- ▶ Identifying correlation between resources based on their availability
- ▶ Standard classification algorithm (K-means)
- ▶ They were able to identify 5 classes of machines

*The average availability of a machine in a grid is a good criterion for the classification*

$$\alpha[j] = \frac{\sum_{k=1}^{nb\_intervalles[j]} a_j^k * vitesse[j]}{nb\_intervalles[j]}$$

**Is the average amount of computation in one interval**



$\alpha[0] = 0$

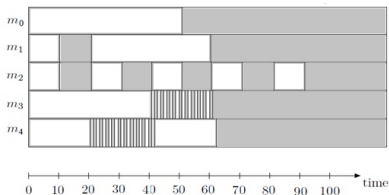
$\alpha[1] = 10$

$\alpha[2] = 20$

$\alpha[3] = 30$

$\alpha[4] = 90$

# Drawback whith Alpha



$$\alpha[0] = 50$$

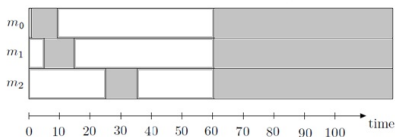
$$\alpha[1] = 25$$

$$\alpha[2] = 10$$

$$\alpha[3] = 50/11 = 4.54$$

$$\alpha[4] = 50/12 = 4.16$$

The alpha parameter does not take into account the dispersion pattern of intervals availability.



$$\alpha[0] = 25$$

$$\alpha[1] = 25$$

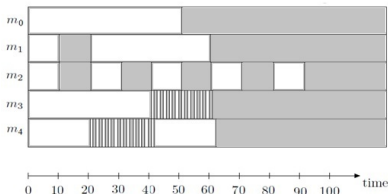
$$\alpha[2] = 25$$

The alpha parameter is insufficient to characterize machines

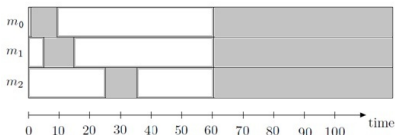


$$\text{beta}[j] = \sum_{k=0}^{nb\_intervalles[j]} (a_j^k - \bar{l}[j])^2$$

Is the variance between availability intervals of machine j



Valeur de alpha	Valeur de beta
alpha[0]= 50	beta[0]=0
alpha[1]= 25	beta[1]=450
alpha[2]= 10	beta[2]=0
alpha[3]= 50/11 = 4.54	beta[3]=138.27
alpha[4]= 50/12 = 4.16	beta[4]=54.69



Valeur de alpha	Valeur de beta
alpha[0]= 25	beta[0]=1152
alpha[1]= 25	beta[1]=1058
alpha[2]=25	beta[2]=0

1. Compute the  $\text{Rank}_u$  for all tasks
2. Compute  $\alpha[j]$  and  $\beta[j]$  for all processors.
3. Sort all tasks in order of decreasing values of  $\text{Rank}_u$ . (Longest First)
6.       **While** there are unscheduled tasks in the list **do**
7.       Select the first task,  $n_i$  from the list
8.       Compute  $\text{EFT}^*(n_i) = \min_{j \in 1..m} (\text{EFT}(n_i, p_j))$
9.       Let  $P_{\text{cand}}$  the list of processor  $p_j$  that  $\text{EFT}(n_i, p_j) \leq \text{EFT}^*(n_i) * (1 + \tau)$
10.      Assign task  $n_i$  to processor  $p_j$  from  $P_{\text{cand}}$  such as  $\alpha[j] / \beta[j]$  is the maximum
11. **endwhile**

**Online execution :** Adjustments to keep the schedule feasible

# Exemple for Tasks allocation in HEFT-ACU



$S_0=S_1=S_2=S_3$

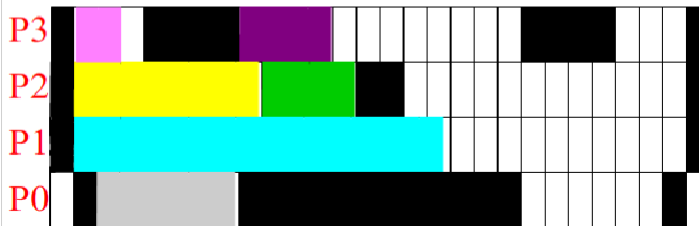
$T_{aut} = 0.5$

$\text{Alpha/Beta}(3)=4.42$

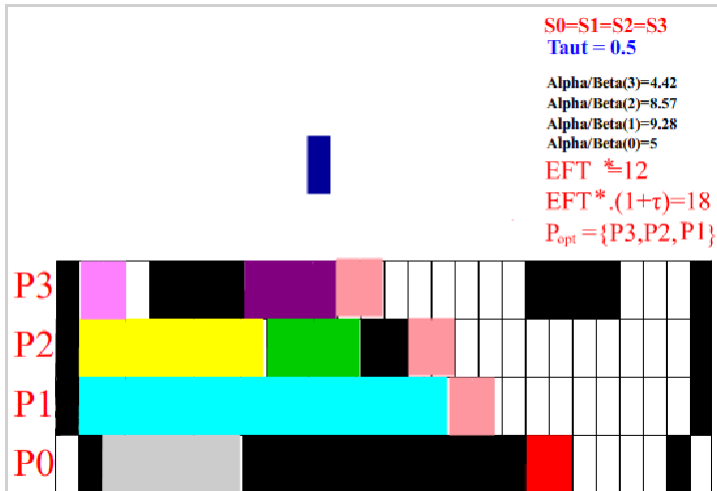
$\text{Alpha/Beta}(2)=8.57$

$\text{Alpha/Beta}(1)=9.28$

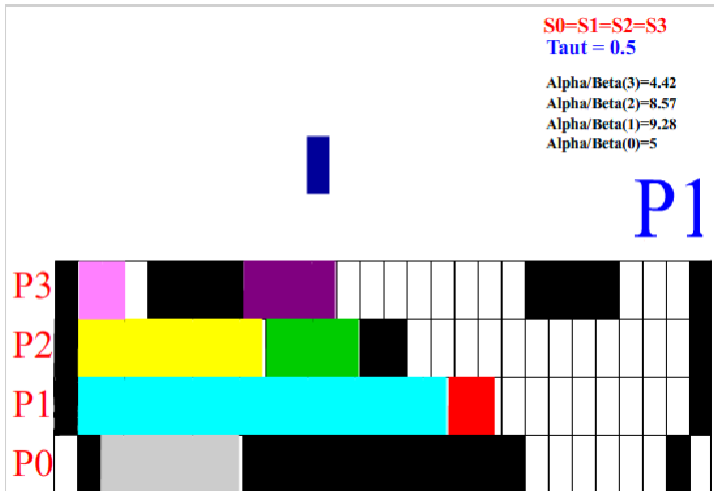
$\text{Alpha/Beta}(0)=5$



# Exemple for Tasks allocation in HEFT-ACU



# Exemple for Tasks allocation in HEFT-ACU



# Exemple for Tasks allocation in HEFT-ACU



$S_0=S_1=S_2=S_3$

$T_{aut} = 0.5$

$\text{Alpha/Beta}(3)=4.42$

$\text{Alpha/Beta}(2)=8.57$

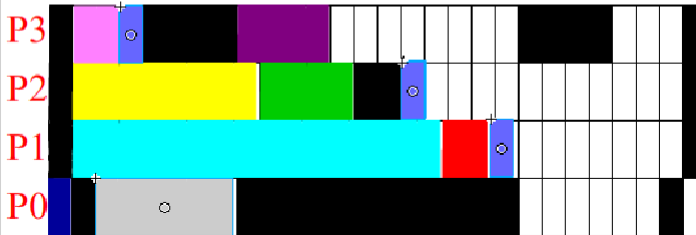
$\text{Alpha/Beta}(1)=9.28$

$\text{Alpha/Beta}(0)=5$

$EFT^*=2$

$EFT^* \cdot (1+\tau)=3$

$P_{opt} = \{P_0\}$



# Exemple for Tasks allocation in HEFT-ACU



29

$V_0=V_1=V_2=V_3=10$

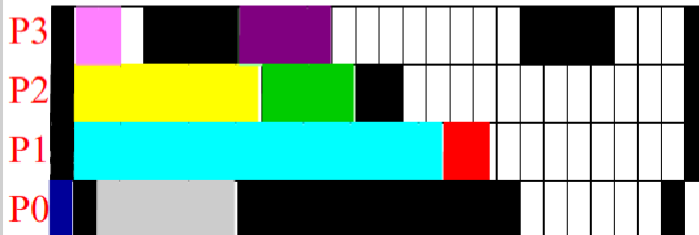
$T_{aut} = 0.5$

$\text{Alpha/Beta}(3)=4.42$

$\text{Alpha/Beta}(2)=8.57$

$\text{Alpha/Beta}(1)=9.28$

$\text{Alpha/Beta}(0)=5$





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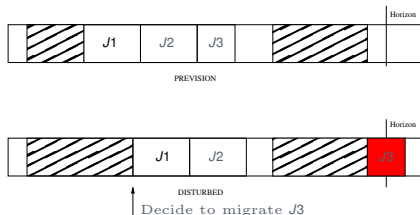


- ▶ Application : a set of tasks
- ▶ execution : all tasks must be executed
- ▶ No garentee : in disturbed environments
- ▶ Solution : Duplucate and/or migrate
- ▶ Our approach : Duplicate tasks if their completion time exceed a limit



- ▶ Desktop grid
- ▶ No control on the host when unavailable
- ▶ No preemption
- ▶ No migration cost (since the task will be sent from the broker to the worker)

- ▶ For all machine  $j$ , Let  $C^j = \max C_i$  for jobs  $i$  scheduled on machine  $j$
- ▶ Define  $horizon^j = \frac{3}{2} C^j$
- ▶ Purpose : In the disturbed execution, all tasks must be scheduled before  $Horizon^j$





- ▶ At the begin of the current availability : identify jobs that exceeds *Horizon<sup>i</sup>*
- ▶ Re-schedule these tasks to a new processor
- ▶ New processor is chosen in order to complete the tasks before *the horizon*
- ▶ Set of *CL* candidate processors
- ▶ Selection Criterion : Processor with highest stability (i.e  $\frac{\alpha}{\beta}$ )



- ▶ Phase 1 : Offline schedule (HEFT-AC)
- ▶ Phase 2 : Online execution with limited reaction mechanism base on delaying start execution time



- ▶ Phase 1 : Offline schedule (HEFT-AC)
- ▶ Phase 2 : Online execution with limited reaction mechanism base on delaying start execution time



- ▶ Phase 1 : Offline schedule (HEFT-AC)
- ▶ Phase 2 : Online Execution with sophisticated reaction mechanism
- ▶ Phase 3 : A decision of migrating the tasks is taken online
- ▶ Phase 3 : minimize the lateness of the completion time



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*Scenario 1:* (without disturbance) Tasks are executed using the planned dates.

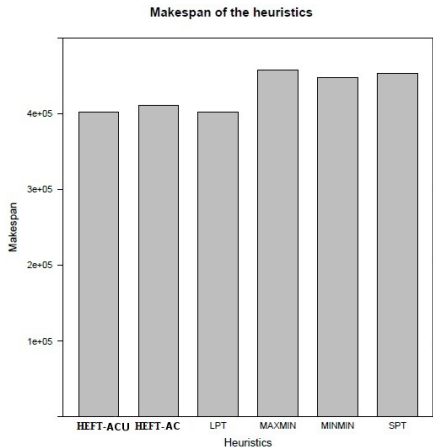
*Scenario 2:* (with disturbance) Potential interruptions of tasks are handled by a local re scheduling mechanism on the same processor.

We designed a specific simulator which supports machine profiles, task profile and disturbance in availability intervals

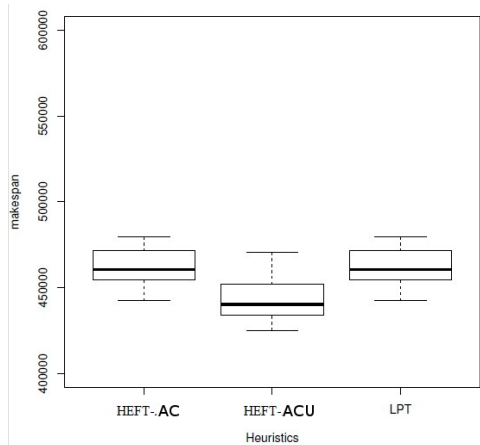


- ▶ Six algorithms are studied :
  - ▶ LPT
  - ▶ SPT
  - ▶ MinMin
  - ▶ MaxMin
  - ▶ HEFT-AC
  - ▶ HEFT-ACU
  
- ▶ Test are performed on 10 different instances
  - ▶ 10000 tasks
  - ▶ 1000 machines
  - ▶  $\tau = 0.2$  (empirically chosen)
  - ▶ Each instance is disturbed 30 times

# Performance Comparison between Heuristics without disturbance



# Performance Comparison between Heuristics with disturbance





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- ▶ We are considering uncertain Desktop grid platforms
- ▶ We adapted HEFT to schedule tasks within the schedule instead of only at the end
- ▶ We use the average and variance of the length of availability intervals to characterise the most stable machines
- ▶ HEFT-ACU is the most stable evaluated algorithm



- ▶ Limited reaction mechanism leads to non-executed jobs
- ▶ We moved from *proactive* approach, to a proactive/reactive approach
- ▶ Primary results : Migration improve disturbed makespan in disturbed environments with at least 5%



Billaut J.C., Moukrim A. and Sanlaville E.  
*Flexibilité et robustesse en ordonnancement.*  
Hermès, 2005.



Essafi A. , Trystram D. and Zaidi Z.  
An Efficient Algorithm for Scheduling Jobs in Volunteer  
Computing Platforms  
*HCW - Proceedings of the 2014 IEEE International Parallel &  
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# The End



## Thank you for your attention